

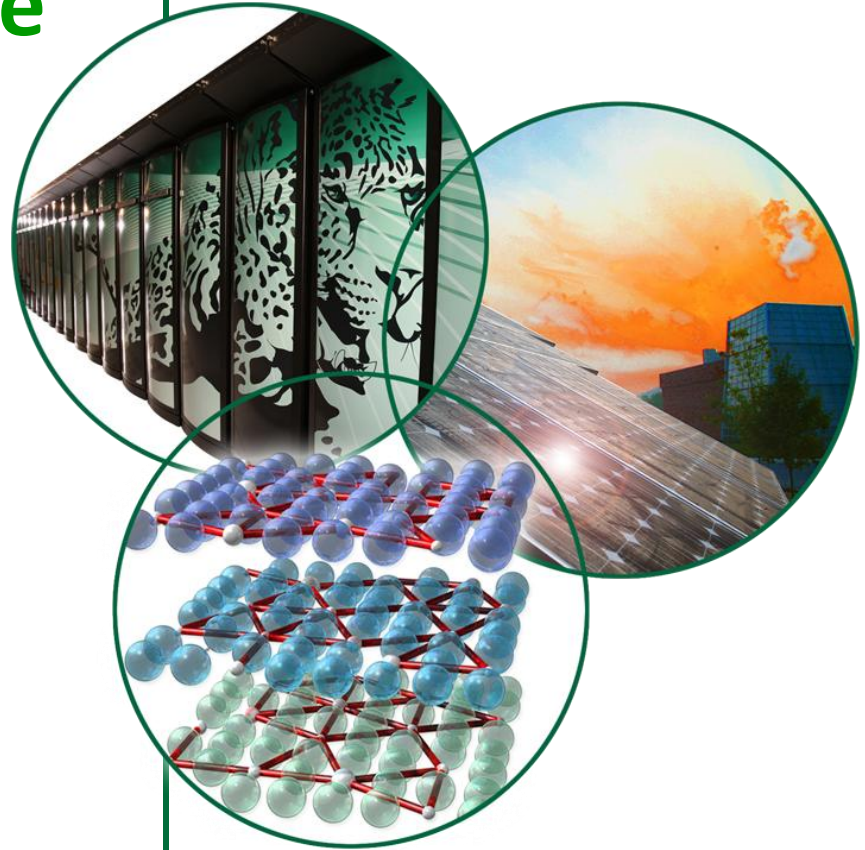
# Data Generated and Needs for Carbon Dioxide Capture and Storage

**Jeffrey M. Bielicki, Ph.D.**

**Weinberg Fellow** | Oak Ridge National  
Laboratory

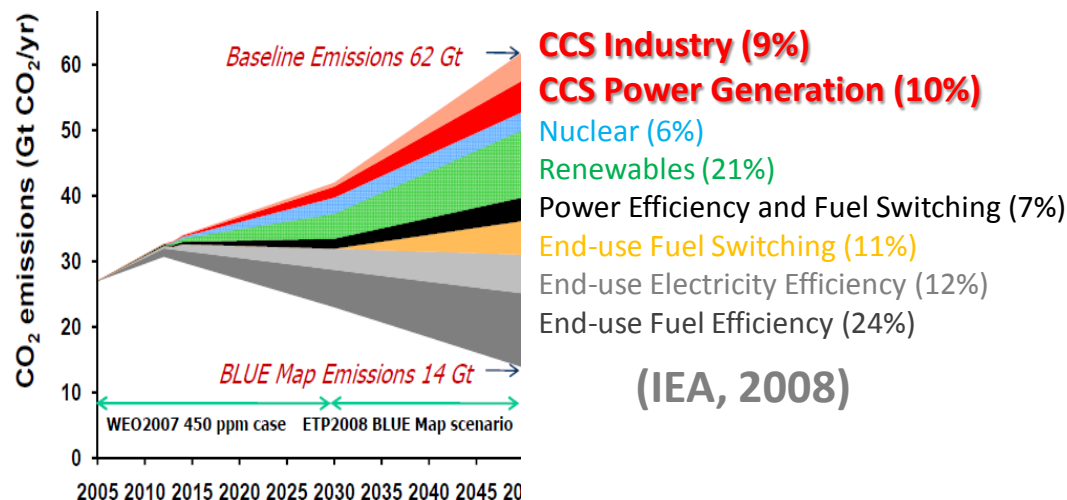
**Fellow in Energy and Technology** | Baker Center  
for Public Policy, University of Tennessee

ESIP Summer Meeting | Energy Cluster | July 22,  
2010



# Scale Matters

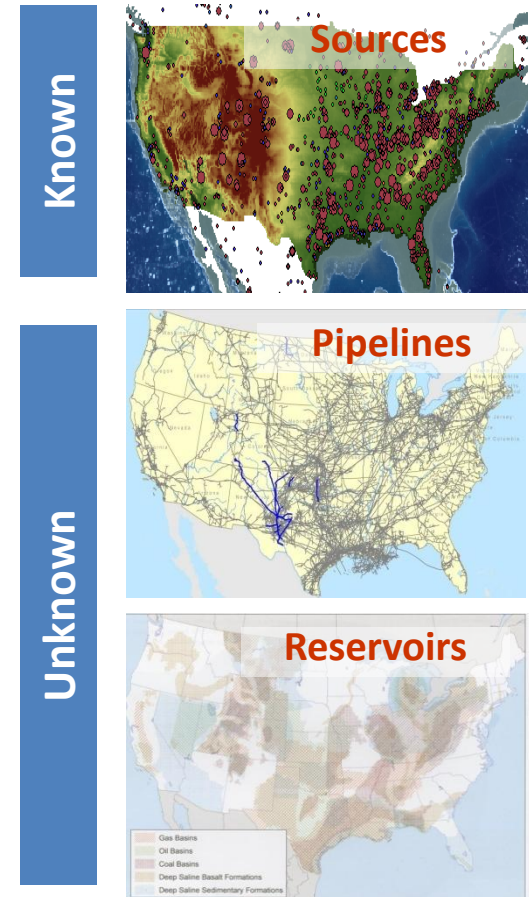
## Magnitude of the Problem:



- **Generalize scaling issues that arise from the interactions and patterns they form.**
- **Deploy as efficiently as possible:** Understand Returns to Scale to locate, organize, and guide deployment of sustainable energy systems.

# Carbon Dioxide Capture and Storage (CCS)

- **Capture CO<sub>2</sub>**
  - Typically from large stationary sources
- **Transport captured CO<sub>2</sub>**
  - Most efficiently by pipeline
- **Store CO<sub>2</sub>**
  - By injection it into geologic reservoirs



# CCS Data Generated and Needed

- **Modeling and Analysis**
  - Producing and analyzing policy-relevant case-study data
- **Experimental, Demonstration, and Project Data**
  - Incorporating and analyzing actual existing data
- **Integrating and Informing**
  - Combining into integrated decision-making frameworks

# Large Stationary CO<sub>2</sub> Sources (in North America; NETL, 2008)

- **UNITED STATES:**

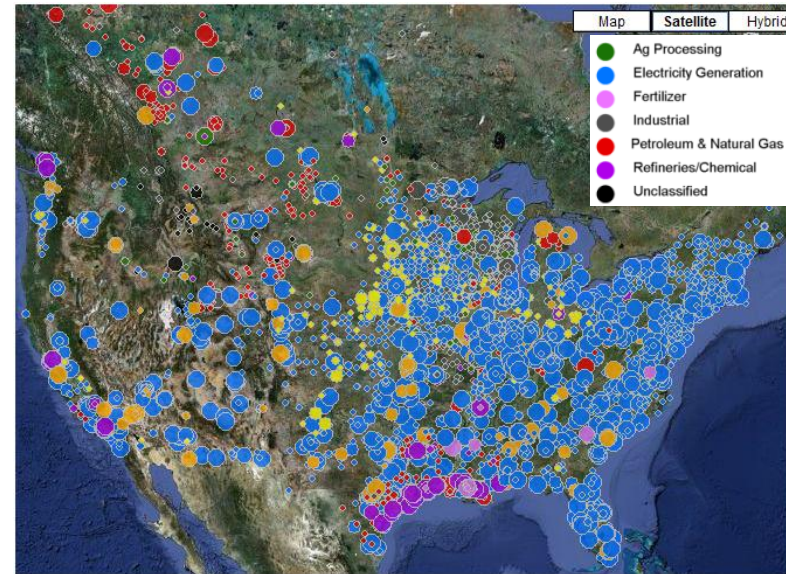
- 4,800 Sources
- 3,300 Mt CO<sub>2</sub> per year

## Estimated Capture Cost by Facility (\$/tCO<sub>2</sub>)

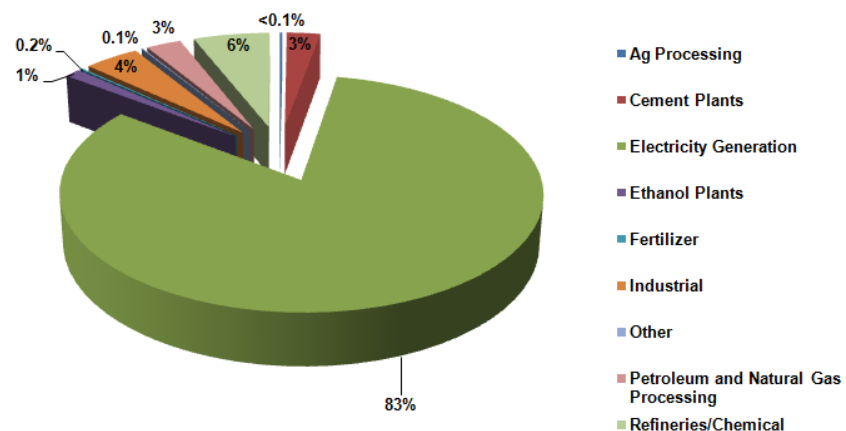
Gas processing: \$16-24  
Chemicals: \$26-30  
Biomass(power):\$41-43  
**Coal (power): \$35-55**  
Pulp and Paper: \$54-68  
Gas (power): \$56-74  
Cement: \$58-102  
Iron and Steel: \$61-71  
Gas (synfuels + H<sub>2</sub>): \$61-101  
Biomass (synfuels + H<sub>2</sub>): \$72-105

- **INDUSTRIAL ORGANIZATION:**

- Coal-fired electricity generation dominates emissions sources
- But low-cost capture sources are not coal

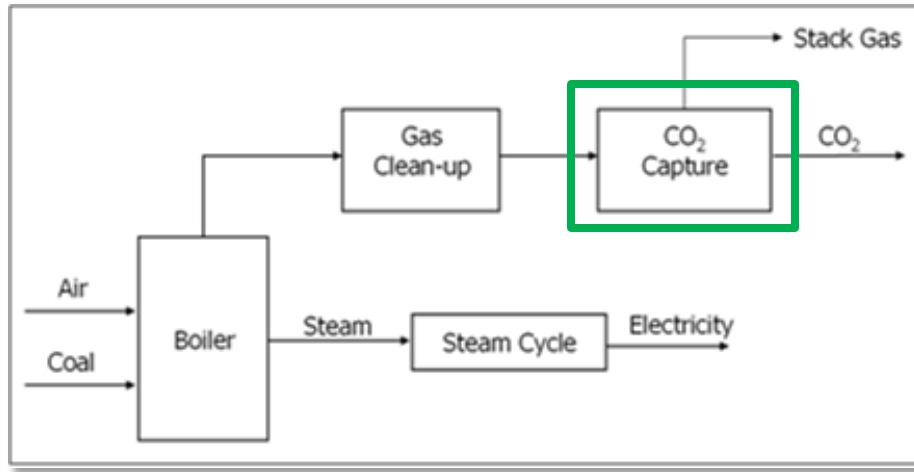


Percentage CO<sub>2</sub> Stationary Source Emissions by Category



# CO<sub>2</sub> Capture Technologies and Source Operations

- Each source has its own characteristic operating characteristics and load



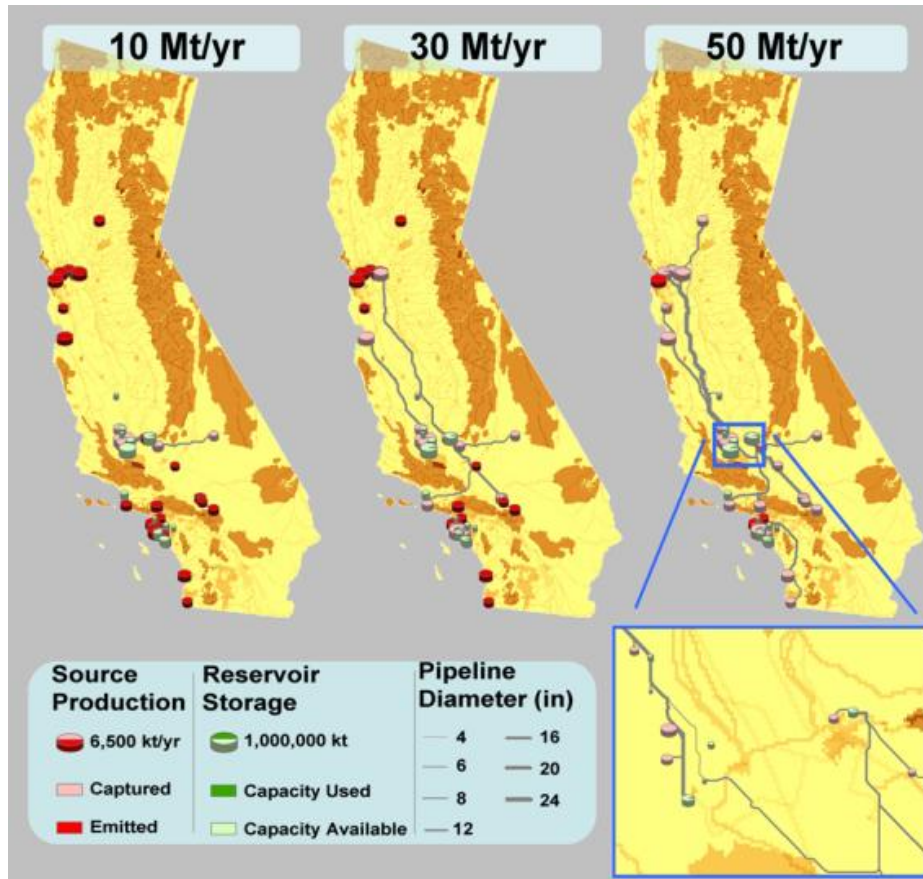
- CO<sub>2</sub> capture options and processes depend on the specifics of the systems:
  - Pre- and post-combustion capture:
    - Physical absorption (e.g., Selexol)
    - Chemical absorption (e.g., MEA)...
  - Oxy-fueled combustion:
    - Combust fuel in pure oxygen; separate oxygen from air prior to combustion.
- Several technologies need to be developed.
  - Cleans more than coal.
  - Cost and energy penalties are considerable.

Adapted from: IEA (2008), EIA (2009), and IPCC (2005).



# Pipeline Transportation of CO<sub>2</sub>

- Siting issues – especially at large scales – can be significant.

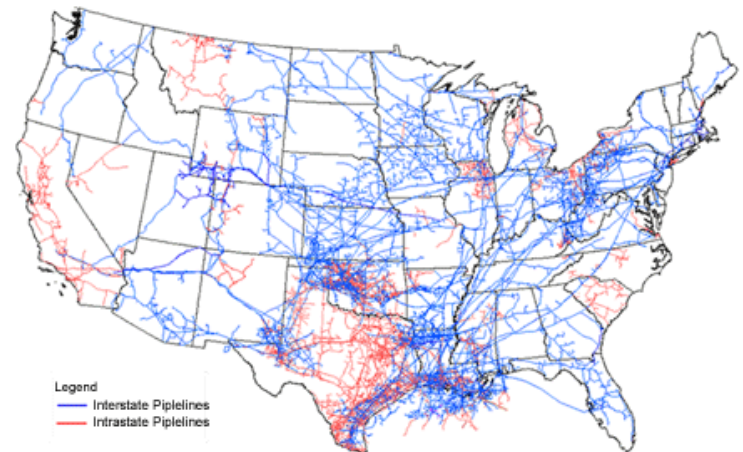


**Middleton and Bielicki (2009a)**

## Construction of Green Pipeline, Denbury Resources Baton Rouge, LA. May, 2009



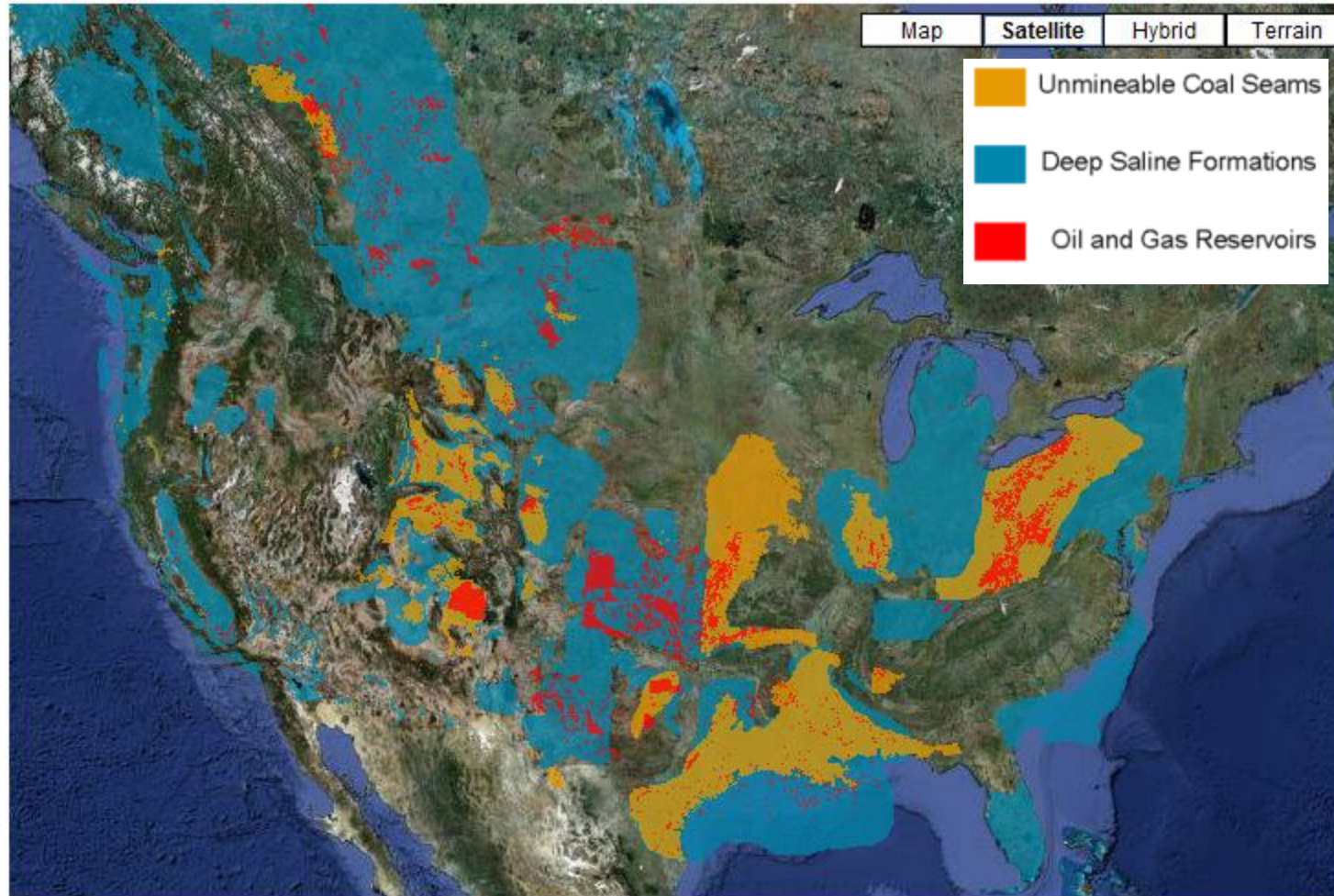
The national natural gas mainline transmission grid is made up of approximately 217,000 miles of interstate pipelines and 89,000 miles of intrastate pipeline.



Source: Energy Information Administration, Natural Gas Transportation Information System, Natural Gas Pipeline Maps Database (December 2008)

[http://tonto.eia.doe.gov/energy\\_in\\_brief/images/charts/ngpipelines\\_map\\_small.png](http://tonto.eia.doe.gov/energy_in_brief/images/charts/ngpipelines_map_small.png)

# Conventional CO<sub>2</sub> Storage Options (NETL, 2008)



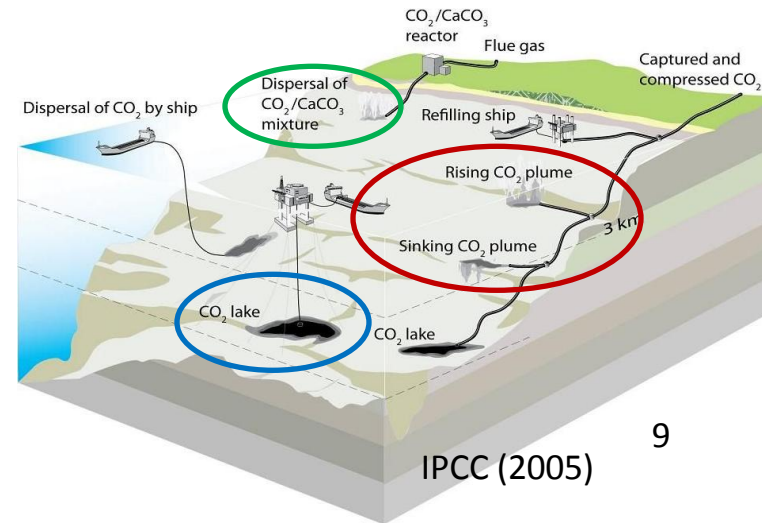


# Other Storage Considerations

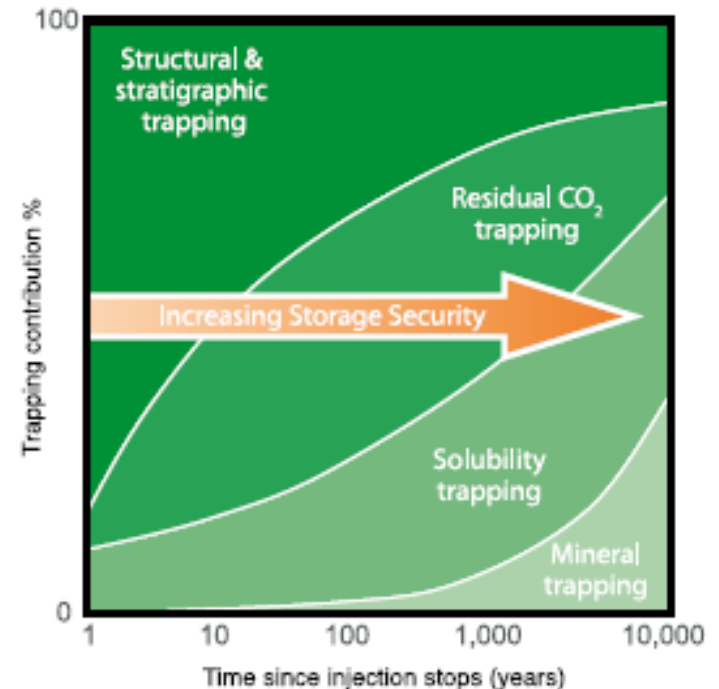
- **Ocean Disposal:** ~80% of atmospheric  $\text{CO}_2$  ends up dissolved in the ocean... Bypass natural process by deliberate injection.

Seawater | “Deep” seawater | Mineral carbonation

- **Storage Security:** Increases the longer  $\text{CO}_2$  is underground.
  - **Carbonate Chemistry** (e.g., Lackner 2004) - React with mine tailings (e.g., serpentine), for example
  - **Deep sea sediment** (e.g., House et al, 2006) - Gravitational trapping,  $\text{CO}_2$  hydrate formation(?)
  - **Basalt** (lava flows, rich in  $\text{MgO}$  and  $\text{CaO}$ ) – Onshore, Offshore Basalt (e.g., Goldberg et al, 2008)



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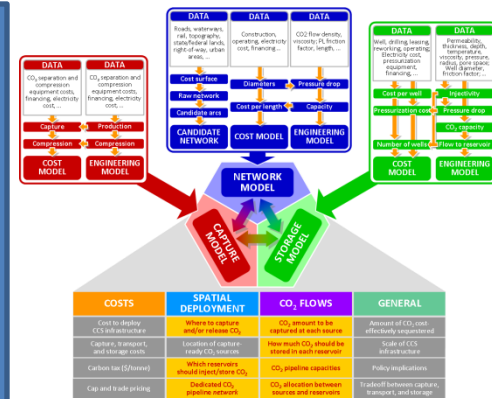


# SimCCS Family of Models\*

- Models that spatially deploy integrated CCS systems based on
  - Scale of CCS system (CO<sub>2</sub> target)
  - CO<sub>2</sub> price (from tax or cap-and-trade system)
- Determines how and where CO<sub>2</sub> should be captured, transported, and stored.
  - Combines engineering, geoscience, and economics
- Realistically generates and routes transportation networks.
  - Suggest “better” routes from overall system perspective.

\*Bielicki (2009a); Middleton and Bielicki (2009a, 2009b); Kuby, Bielicki, and Middleton (2010); Middleton, Bielicki, and Kuby (2010);

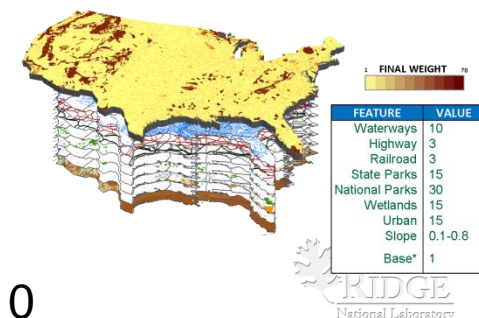
## Engineering-Economic



## Mixed-Integer LP

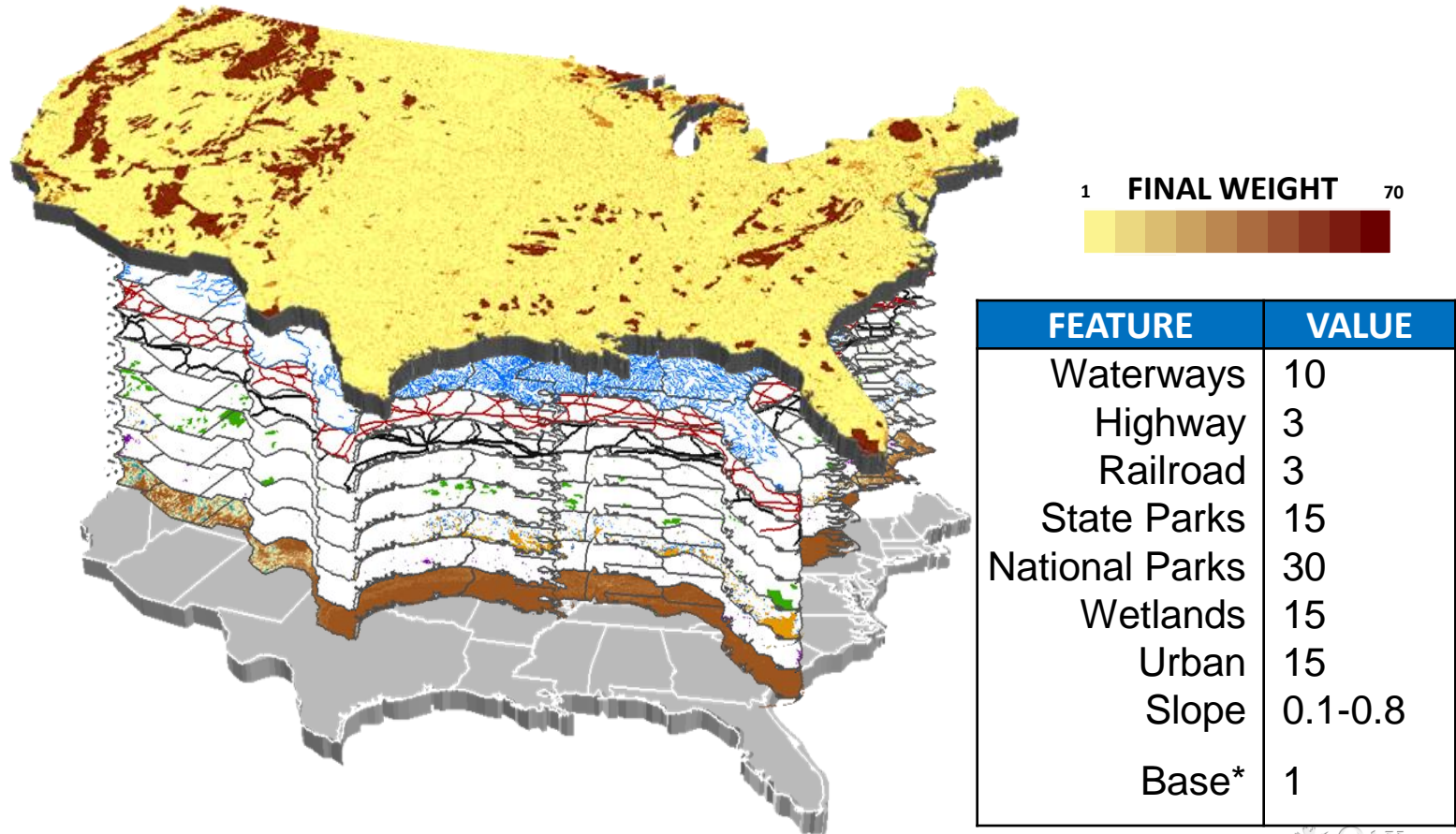
SOURCE	TRANSPORT	RESERVOIR	CO <sub>2</sub> PRICE	EOR
MINIMIZE $\sum_{i \in I} (F_i^c s_i + V_i^c a_i) + \sum_{i \in I} \sum_{j \in J} F_{ij}^t y_{ij} + \sum_{i \in I} \sum_{j \in J} V_{ij}^r x_{ij} + \sum_{i \in I} (F_i^r r_i + V_i^r b_i) + \sum_{i \in I} C_i (Q_i - a_i) - \sum_{i \in I} E_i b_i$				
(1) $x_{ij} - \sum_{d \in D} Q_{ijd}^d y_{ij} \leq 0$	$\forall i \in I, j \in N$	CO <sub>2</sub> flow must be less than maximum pipeline capacity		
(2) $x_{ij} - \sum_{d \in D} Q_{ijd}^d y_{ij} \geq 0$	$\forall i \in I, j \in N$	CO <sub>2</sub> flow must be more than minimum pipeline capacity		
(3) $\sum_{j \in J} x_{ij} - \sum_{j \in J} x_{ij} - a_i + b_i = 0$	$\forall i \in I$	CO <sub>2</sub> flow leaving a node must equal inflow		
(4) $a_i - Q_i^c r_i \leq 0$	$\forall i \in S$	CO <sub>2</sub> captured at a source must not exceed supply		
(5) $b_j - Q_j^r r_j \leq 0$	$\forall j \in R$	CO <sub>2</sub> stored at a sink must not exceed capacity		
(6) $\sum_{i \in I} a_i \geq T$		Target amount of CO <sub>2</sub> to store or sequester		
(7) $\sum_{d \in D} y_{ij} \leq 1$	$\forall i \in I, j \in N$	Only one pipeline can be built between nodes		
$y_{ij} \in \{0,1\} \quad \forall i \in I, j \in N, d \in D$		$x_{ij} \geq 0 \quad \forall i \in I, j \in N$		
$s_i \in \{0,1\} \quad \forall i \in S$		$a_i \geq 0 \quad \forall i \in S$		
$r_j \in \{0,1\} \quad \forall j \in R$		$b_j \geq 0 \quad \forall j \in R$		
0.1 constraints		Non-negativity constraints		

## Cost Surface



# Routing Pipelines

- Shortest path algorithm incorporates social and physical topography:
  - Relative cost of routing through cell (1km x 1km)



# California Infrastructure Example

## 37 Potential Sources (S37)

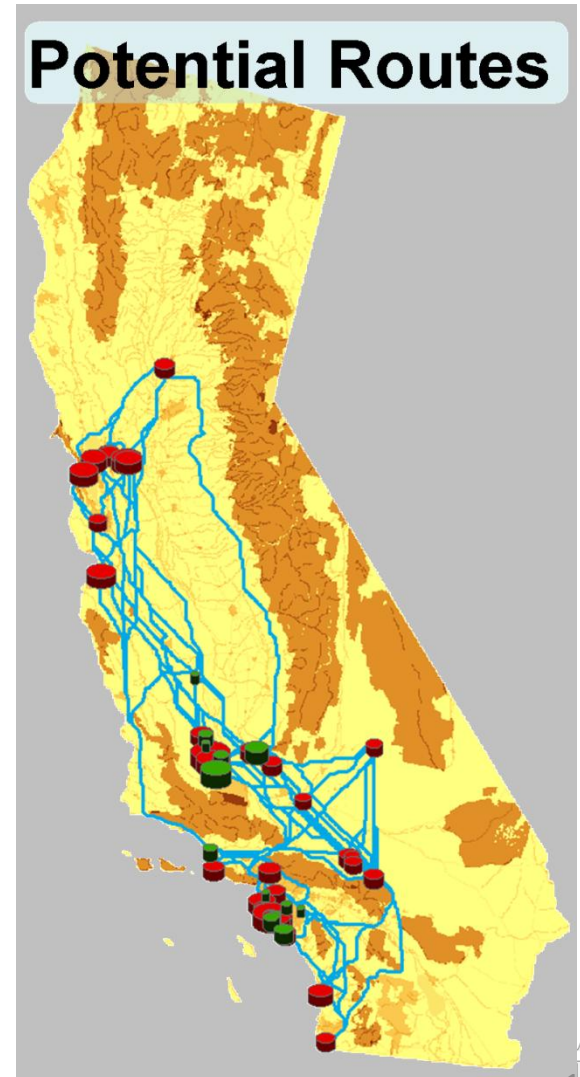
## 14 Potential Reservoirs (R14)

## Potential Routes

- *Between every S-R combination.*
- *Avoid darker patches.*

California		CO <sub>2</sub> Capacity [(S) kt/yr; (R) kt]		Estimated Cost [\$/t <sub>CO2</sub> ]	
Code	Description	Mean	S.D.	Mean	S.D.
S4	4 largest sources	3,889	1,108	39.86	0.18
S12	12 largest sources	2,886	962	45.09	7.80
S37	37 largest sources	1,752	986	44.17	7.12
SB23	23 largest (Bay area)	952	756	42.33	6.38
SLA18	18 largest (LA area)	1,358	765	45.35	7.50
R1	Largest CO <sub>2</sub> capacity oil field	410,554	-	3.68	-
R2	2 largest CO <sub>2</sub> capacity oil fields	328,769	115,661	2.75	1.32
R3	3 largest CO <sub>2</sub> capacity oil fields	270,643	129,710	2.78	0.97
R5	5 largest CO <sub>2</sub> capacity oil fields	210,718	123,115	3.86	1.80
R14	14 largest CO <sub>2</sub> capacity oil fields	110,639	105,917	4.01	1.15
R54-R5	6-54 <sup>th</sup> largest	18,497	21,911	3.60	2.05

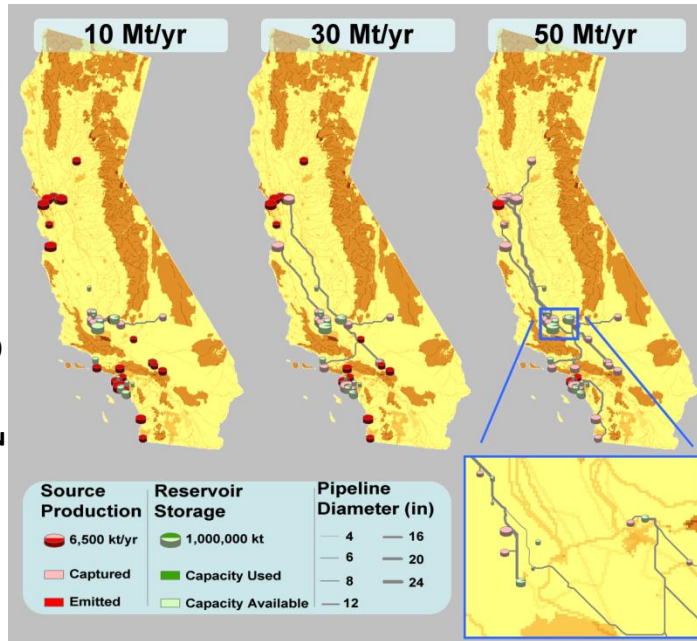
Estimated capacities and costs from Bielicki (2008) methodology applied to Westcarb data.



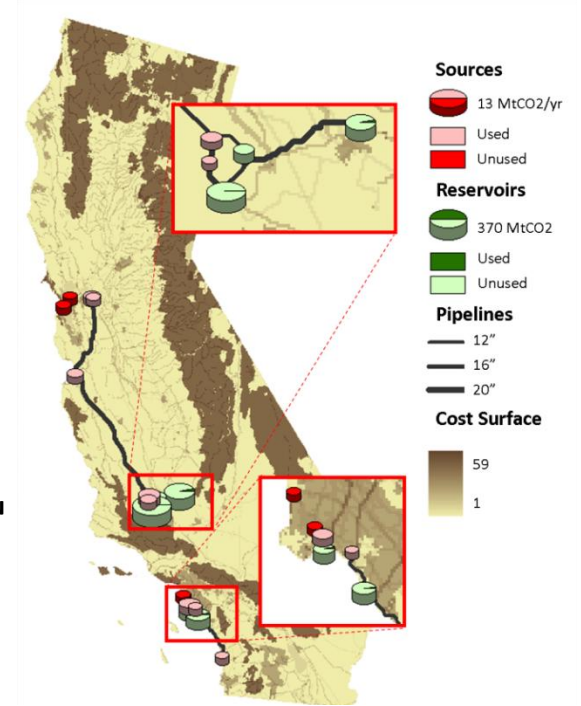


# Example Case Studies in California

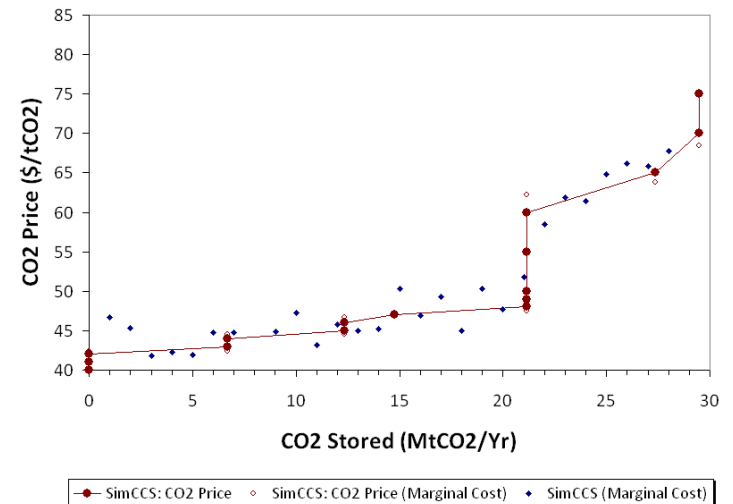
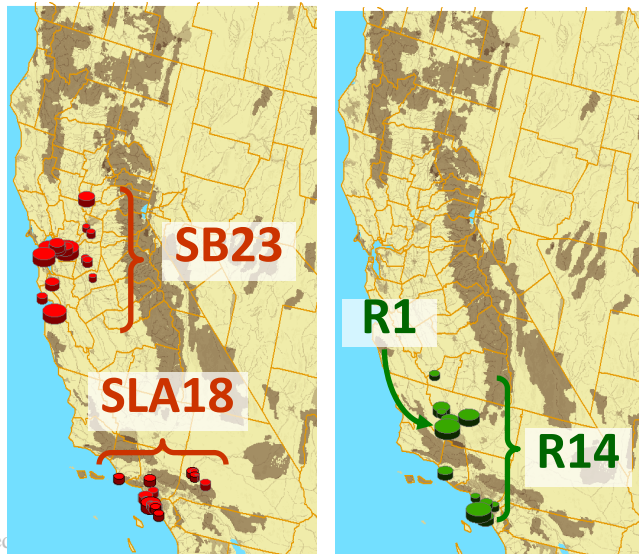
CO<sub>2</sub> Target: **S37** **R14**



CO<sub>2</sub> Price: **S12** **R5**



Spatial Clustering:



# Generalizing Case Studies with Complicated Econometrics (Bielicki, 2008; Bielicki, 2009a)

$$\ln(C) = \alpha_0 + \alpha^Y \ln(Y) + \sum_i \beta_i^W \ln(W_i) + \sum_i \phi_i^Z \ln(Z_i) + \frac{1}{2} \delta^{YY} (\ln(Y))^2 + \dots$$

$$+ \frac{1}{2} \sum_i \sum_j \gamma_{ij}^{WW} \ln(W_i) \ln(W_j) + \frac{1}{2} \sum_i \sum_j \psi_{ij}^{ZZ} \ln(Z_i) \ln(Z_j) + \dots$$

$$+ \ln(Y) \sum_i \rho_i^{YW} \ln(W_i) + \ln(Y) \sum_i \mu_i^{YZ} \ln(Z_i) + \sum_i \sum_j \lambda_{ij}^{WZ} \ln(W_i) \ln(Z_j)$$

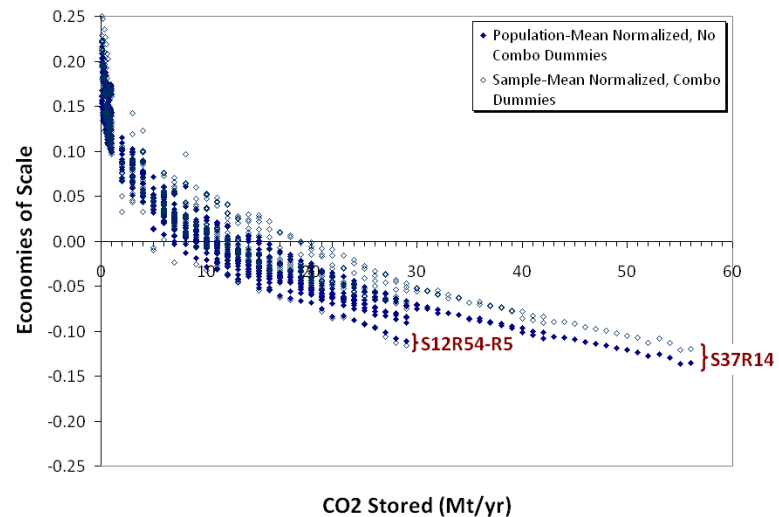
$Y = \text{scale}$

$W_i = \text{cost}_i$

$Z_i = \text{vector of important things}$

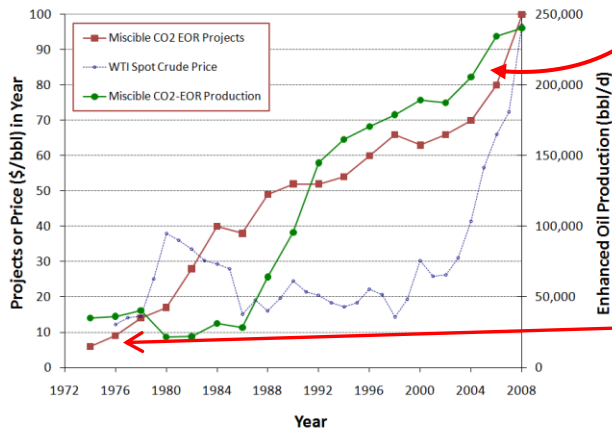
$$\varepsilon_{W_i} \equiv \frac{\partial \ln(C)}{\partial \ln(W_i)}$$

$$RTS \equiv \frac{1}{\sum_{i \in X} \varepsilon_i}$$



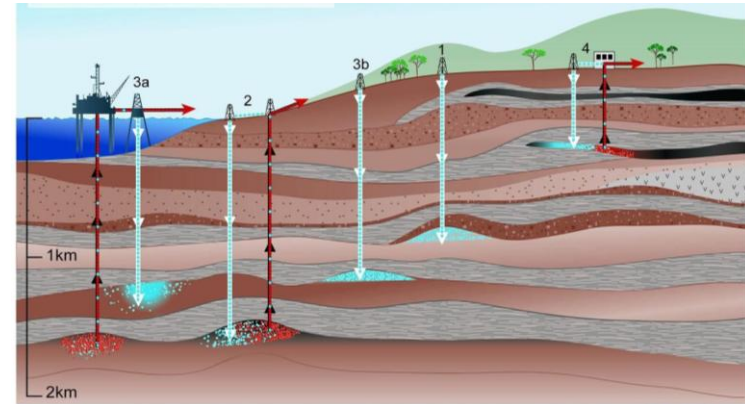
# Actual Data: CO<sub>2</sub> Injection Experience

- **Enhanced Oil Recovery (EOR)** - Inject CO<sub>2</sub> into oil fields to enhance oil production.



Steady increase in the number of projects reported.

Have been injecting CO<sub>2</sub> for EOR since the early 1970's.



# Technological Learning (Bielicki, 2009a; Bielicki, 2010)

- **Typical Learning Curve**

$$C_t = C_0 \left( \frac{Q_t}{q_0} \right)^{-\beta}$$

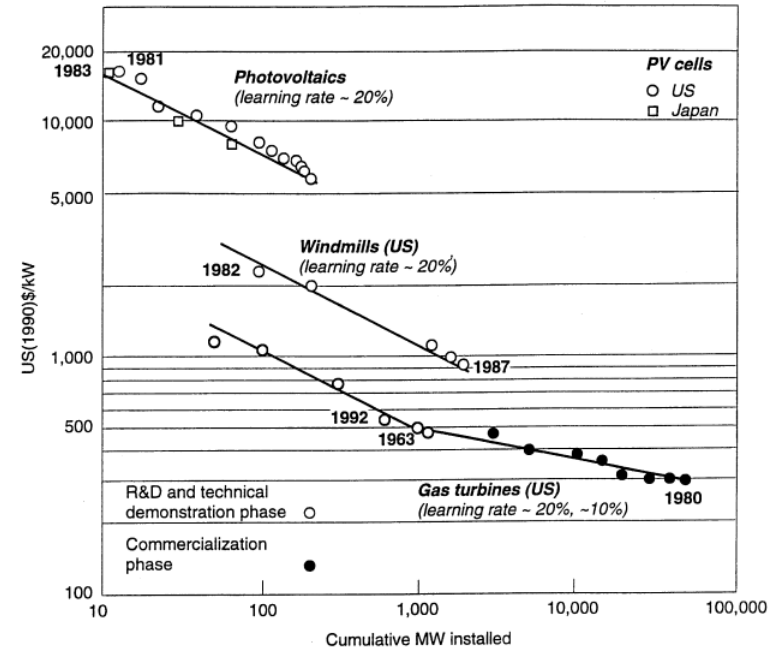
$C_{t,0}$  = Cost at  $(t, t=0)$   
 $Q_t, q_0$  = Cumulative quantity at  $(t, t=0)$   
 $\beta$  = learning coefficient

- **Learning for CO<sub>2</sub>-EOR**

$$E_{bbl/d,t} = e^{\omega \cdot a} \cdot q_{t-1}^{\phi} \cdot E_{bbl/d,t-1}^{\theta} \cdot Q_t^{\beta}$$

- **For CO<sub>2</sub>-EOR**

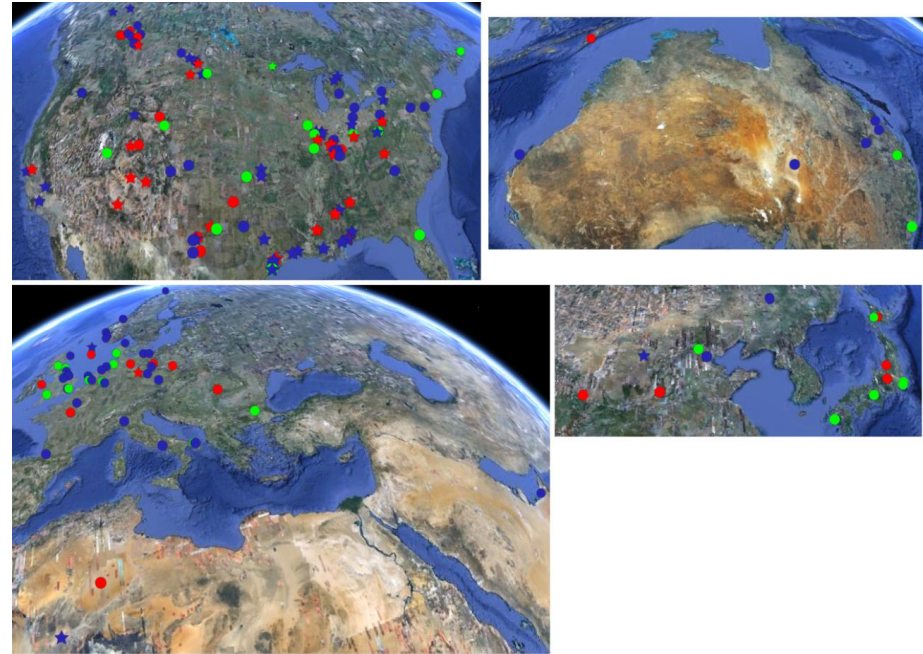
- Physical model of reservoir response
- Control for depleting resource
- Control for geology
- Separate for project and operator spillovers





# Integrated Data Needed

- Five industrial scale fully integrated CCS projects
- 129 documented CO<sub>2</sub> injection projects (GCCSI, 2009).
- **At present, data is mostly siloed, as is the knowledge and learning generated from it.**



# Advancing CCS

- **A lot of data are being generated**
  - Highly specific, component and process
  - Very compartmentalized
- **A lot of data can be generated**
  - Case studies, simulations
- **Integration and common databases are needed**
  - For analysis across projects and activities
- **Integrative decision-making models are required**

# Contact Information

**Jeffrey M. Bielicki, Ph.D.**

**Weinberg Fellow | Energy and Transportation Science Division |  
Oak Ridge National Laboratory | [bielickijm@ornl.gov](mailto:bielickijm@ornl.gov)**

**Fellow in Energy and Environmental Policy | Baker Center for  
Public Policy | University of Tennessee**

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